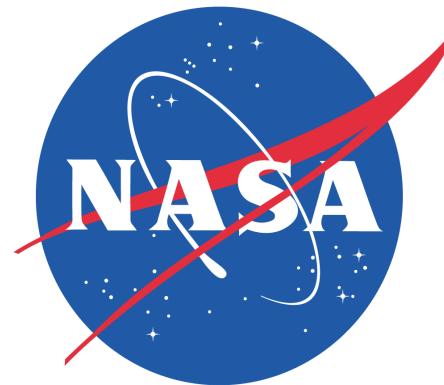


What have we learned from MODIS chlorophyll fluorescence?

From OSU: Toby K. Westberry, Michael J. Behrenfeld,
Allen J. Milligan

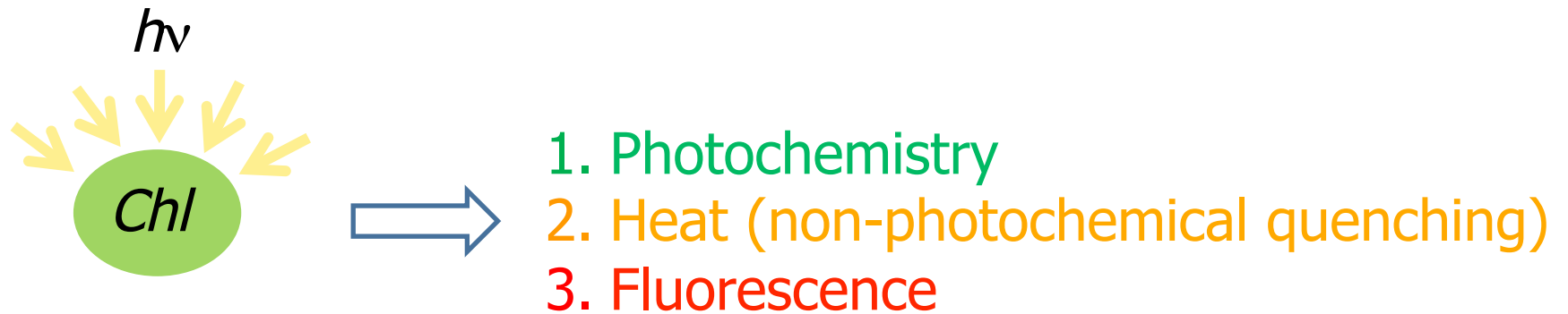
From GSFC: Chuck McClain, Bryan Franz, Gene
Feldman

Others: Emmanuel Boss, Dave Siegel, Scott Doney,
Ivan Lima, Jerry Wiggert, Natalie Mahowald



What is Chlorophyll fluorescence?

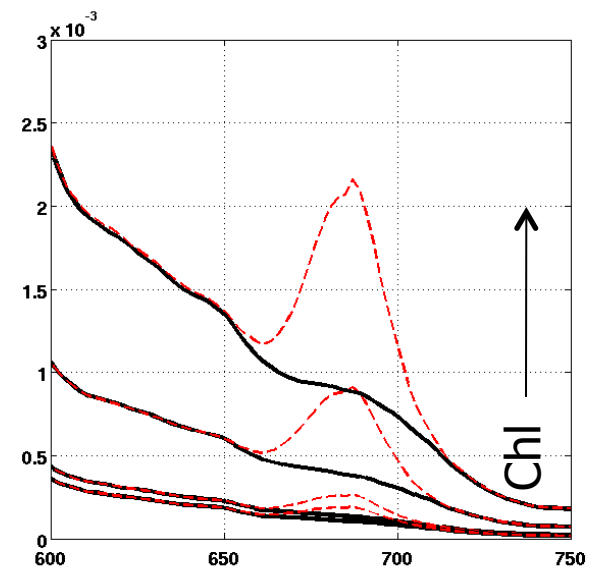
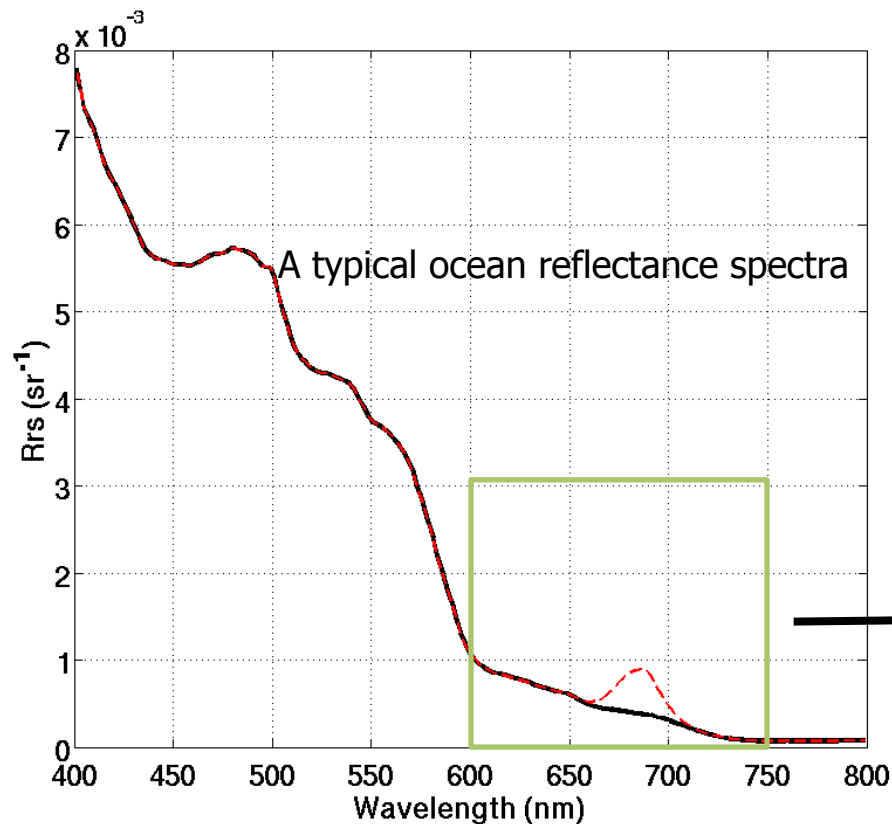
- Chlorophyll-a (Chl) is a ubiquitous plant pigment
- Chl dissipates some of its absorbed energy as photons (i.e., fluorescence)



- Fluorescence occurs under natural sunlight
- Fluoresced radiation is discernable in upwelled radiant flux

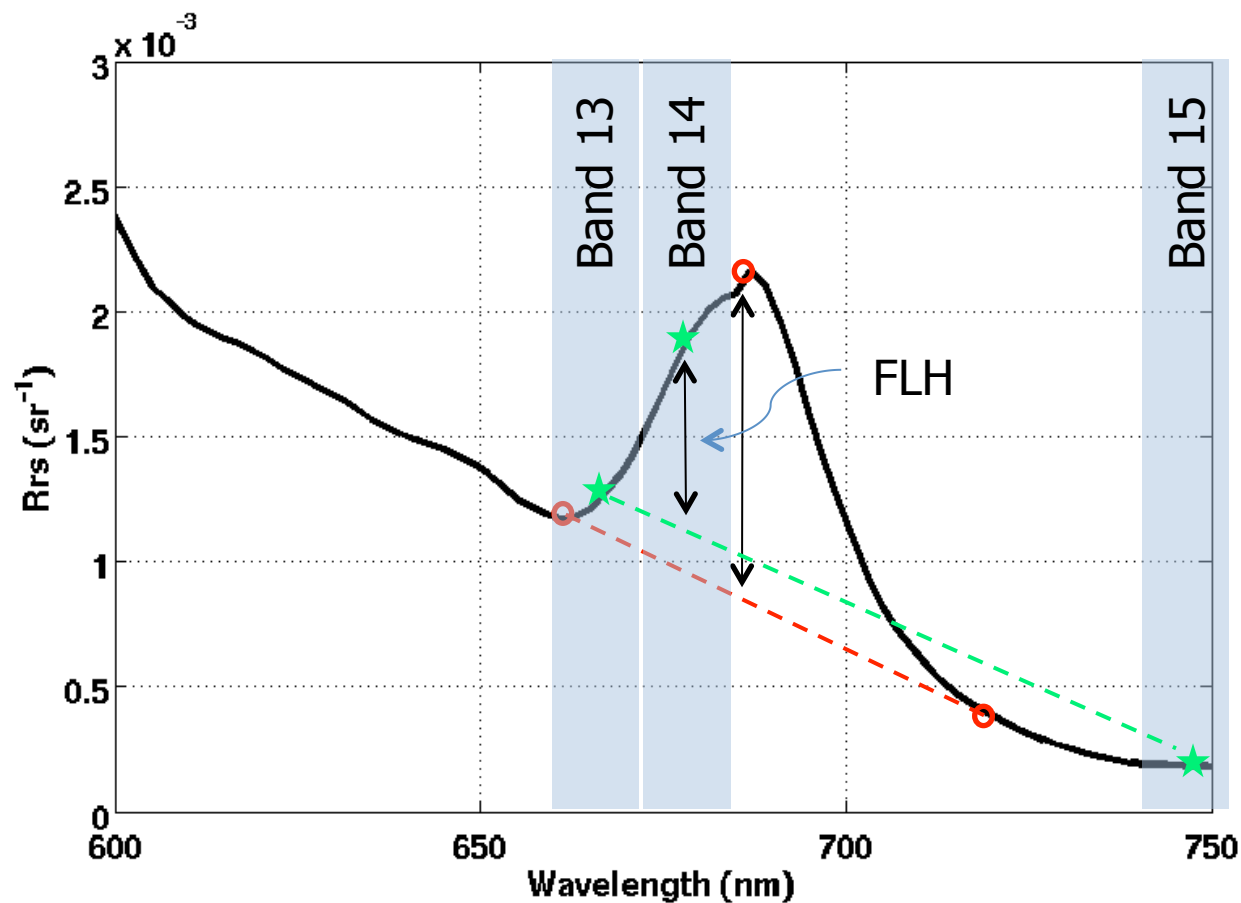
What is Chlorophyll fluorescence?

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MODIS Fluorescence Line Height (FLH)

- A geometric definition
- Can be related to total fluoresced flux (e.g., Huot et al., 2005)



Why MODIS FLH?

- Alternative & independent measure of chlorophyll (particularly in coastal environments)
- Improved NPP estimates
- Index of phytoplankton physiology
 - Pigment Packaging
 - Non-photochemical quenching
 - Nutrient stress effects
 - Photoacclimation

OLD

NEW

Derivation of φ (Fluorescence quantum yield)

Absorbed energy

$$FLH = Chl_{sat} \times \langle a_{ph}^* \rangle \times PAR \times \varphi \times S$$

↑ ↑ ↑

satellite chlorophyll- fluorescence
chlorophyll specific quantum
 absorption yield

- subtract small *FLH* value of $0.001 \text{ mW cm}^{-2} \mu\text{m}^{-1} \text{ sr}^{-1}$ to satisfy requirement that $FLH = 0$ when $\text{Chl} = 0$

Derivation of ϕ (Fluorescence quantum yield)

full spectral fluorescence emission relative to 683 nm

air-sea interface

Isotropic emission

incident scalar PAR

FLH

$$\phi_{\text{sat}} = \frac{4\pi n_w^2 C_f}{t F_0(678)} \frac{E_d(0^+, 678) F_{\text{sat}}}{\int_{400}^{700} \frac{\lambda}{hc} \frac{1}{K(\lambda) + k_L(678)} a_{ph}(\lambda) E_0(0^-, \lambda) d\lambda}$$

TOA irradiance

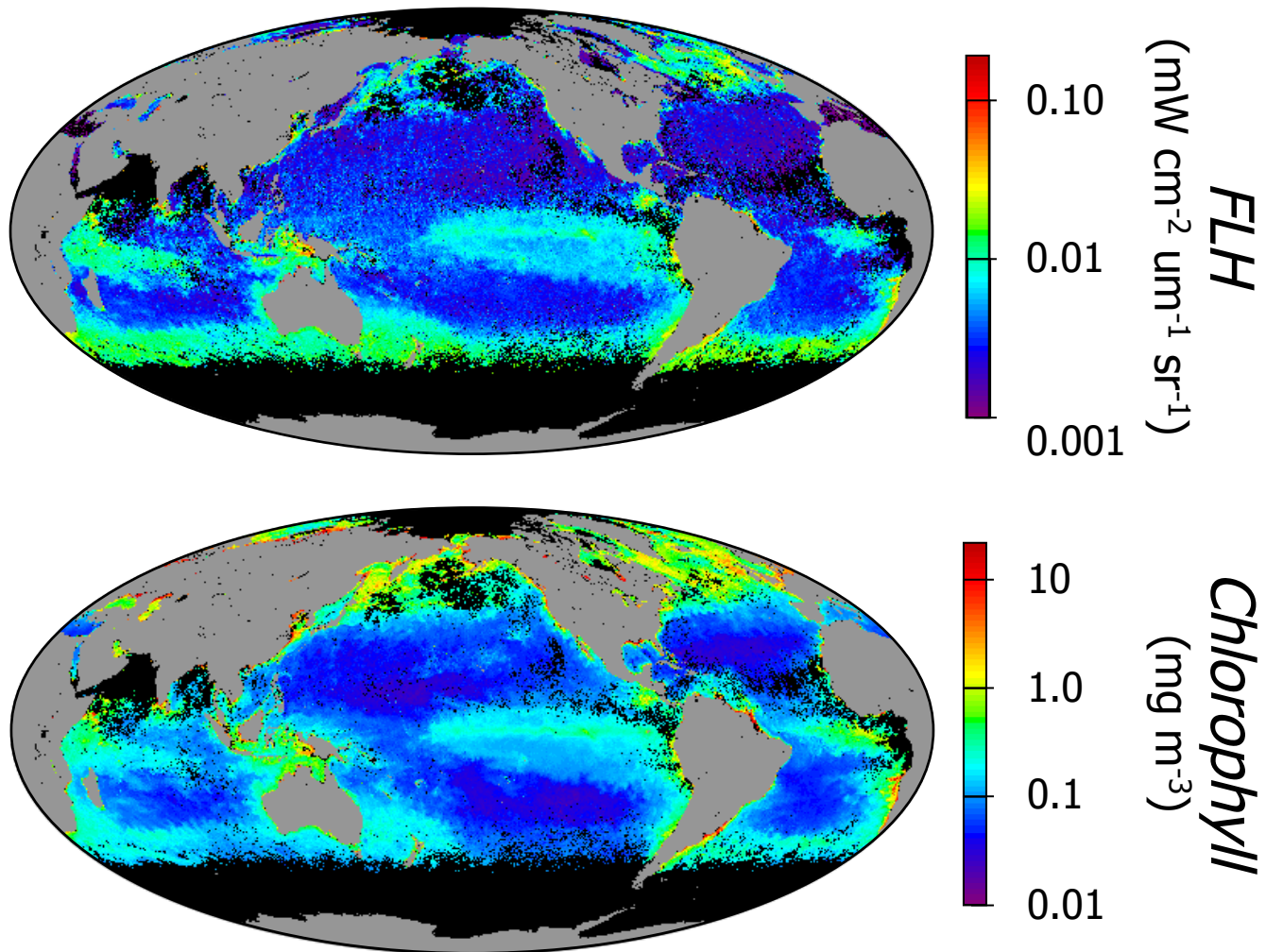
attenuation of downwelling radiation

attenuation of upwelling fluorescence

phytoplankton absorption

spectral irradiance

Results - Global MODIS FLH



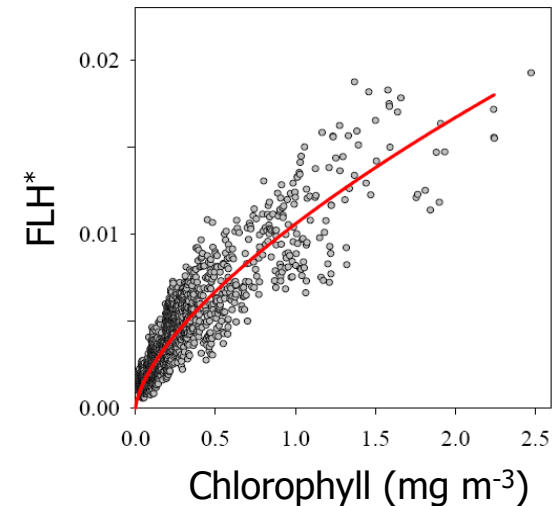
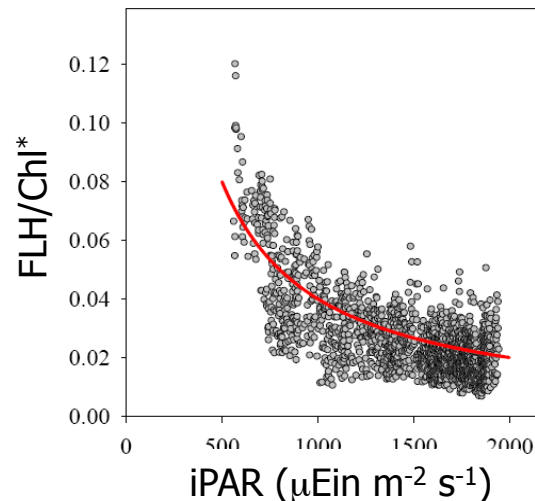
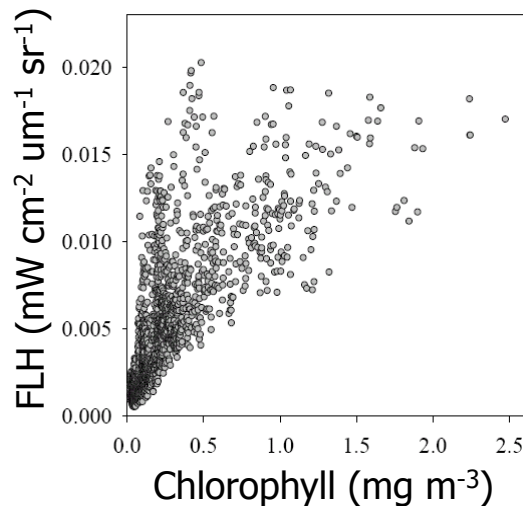
Results - Global MODIS FLH

Three primary factors regulate global phytoplankton fluorescence distributions:

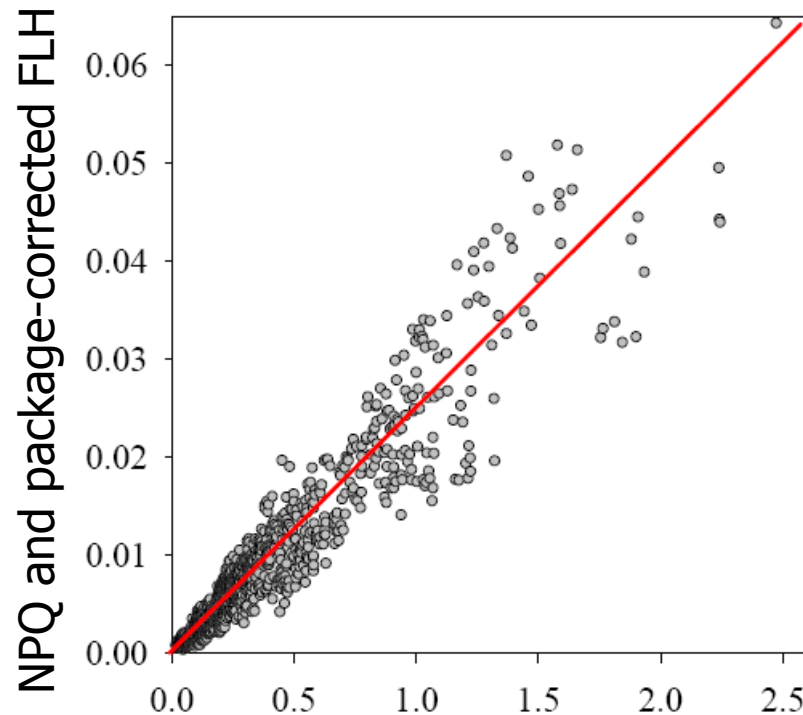
#1. Pigment concentrations (Chl)

#2. Light (non-photochemical quenching)

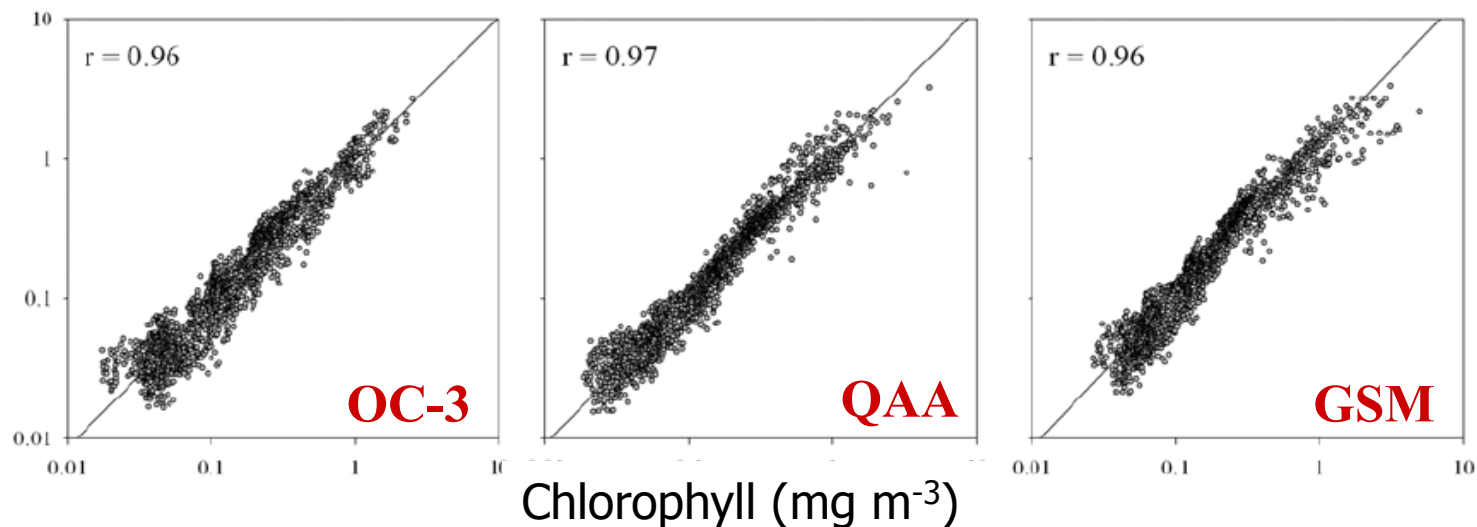
#3. "Pigment packaging"



Results - Global MODIS FLH



- After correction for NPQ and pigment packaging
- **What do we expect in the remaining variability?**

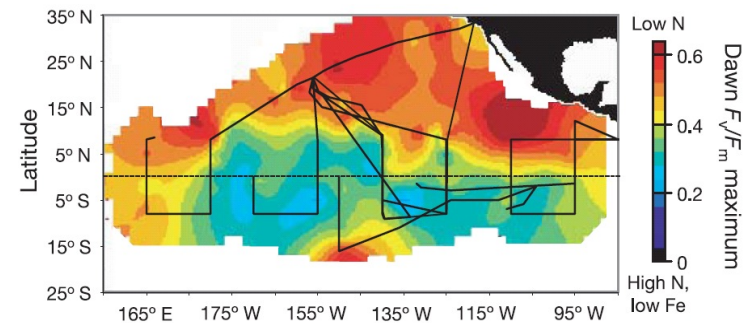


What do we expect in remaining variability?

#1. Unique consequences of iron stress

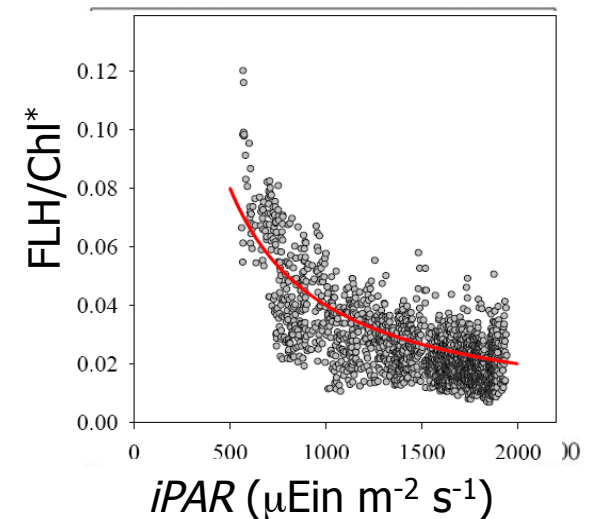
- Over-expression of pigment complexes
- Increases in PSII:PSI ratio

1. Chlorophyll = PSII & PSI
2. Fluorescence = PSII
3. φ increases with PSII:PSI ratio

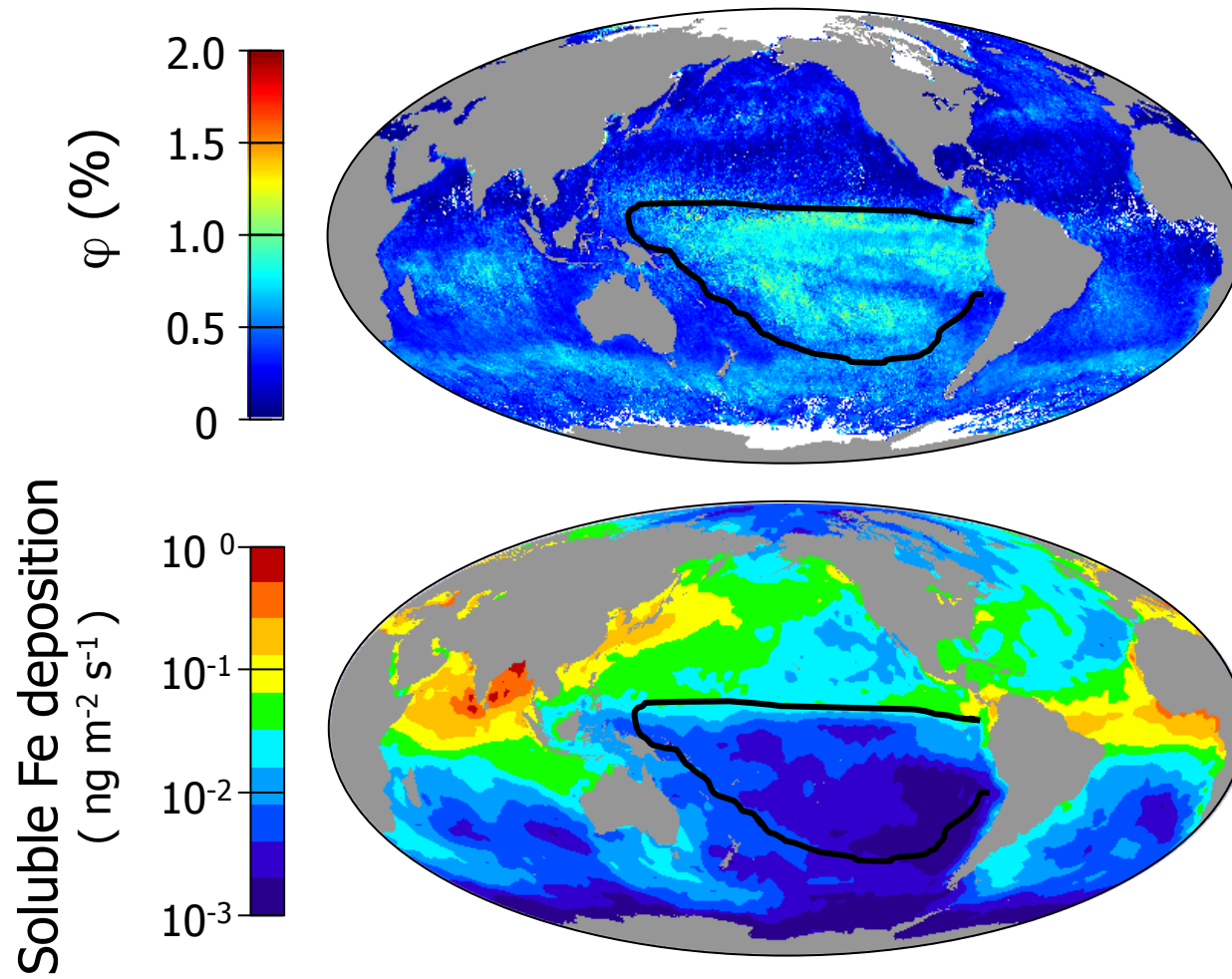


#2. Photoacclimation

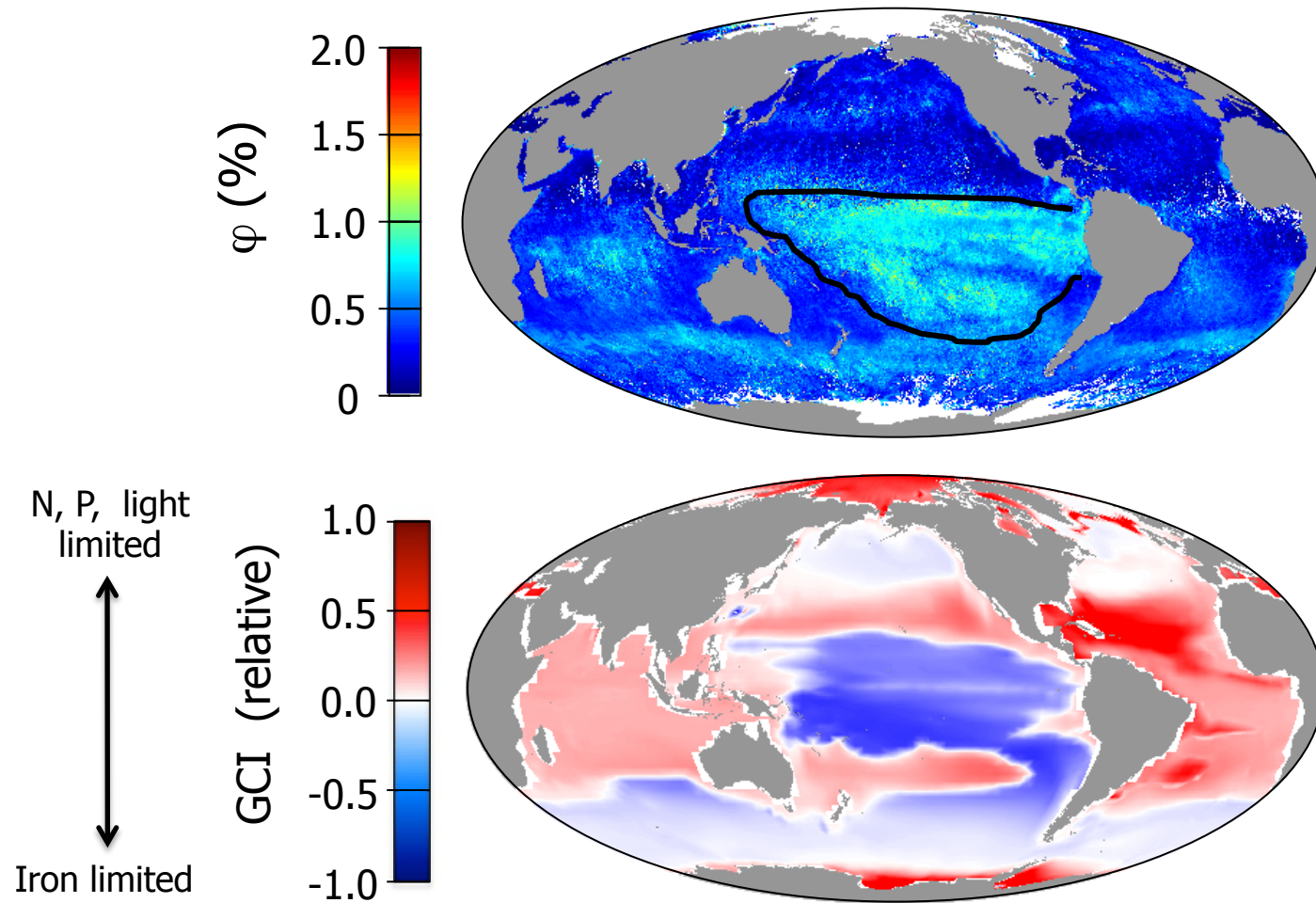
- Low light = enhanced NPQ at any given $iPAR$
→ lower φ



Fluorescence Quantum Yields (φ)



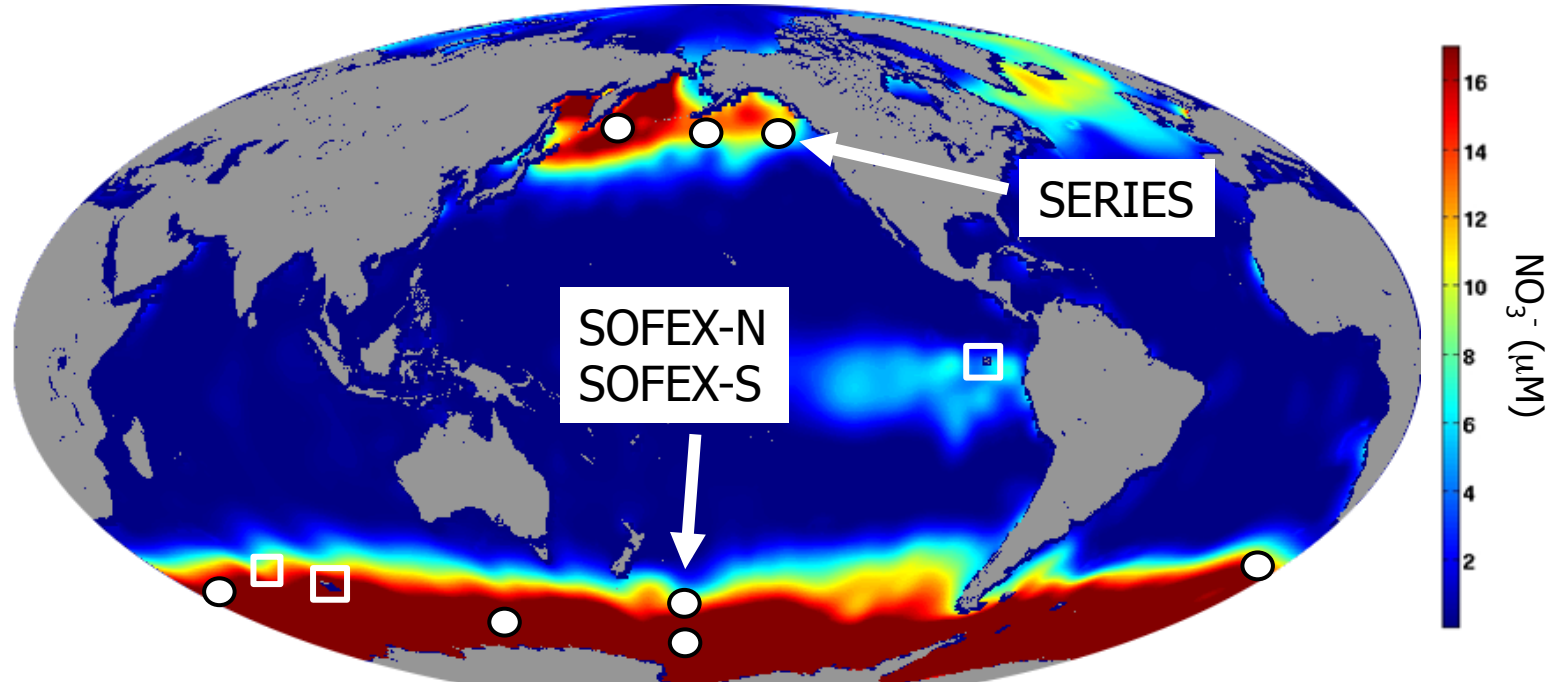
Fluorescence Quantum Yields (φ)



Fluorescence Quantum Yields (φ) and iron

- Broadscale correspondence between fluorescence and degree of Fe stress
 - $\nearrow \varphi$ when Fe is low
 - $\searrow \varphi$ when Fe is high
- Is this causal? How can we test? What might we expect?

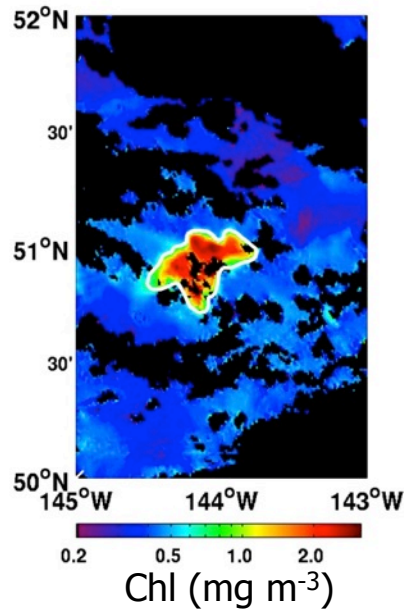
Fluorescence and Fe enrichment experiments



- SERIES – (Subarctic Ecosystem Response to Iron Enrichment Study), Jul/Aug 2002
- SOFeX - (Southern Ocean Iron (Fe) Experiment), Jan/Feb 2002

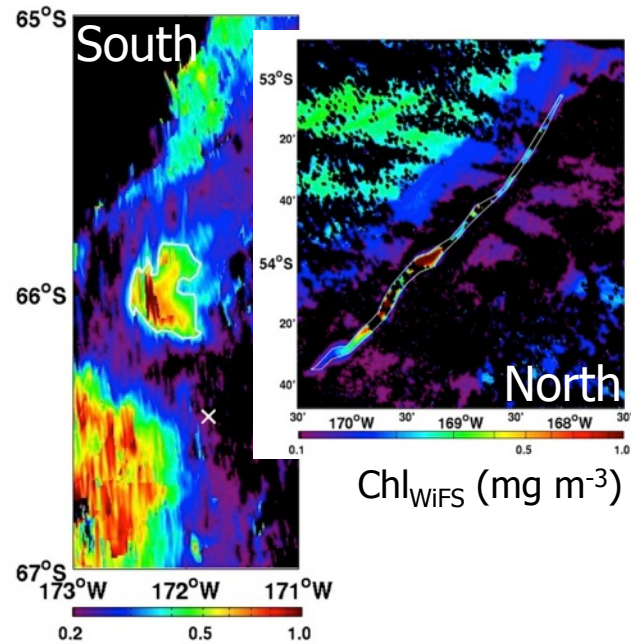
Fluorescence and Fe enrichment experiments -SERIES

SeaWiFS
29 Jul 2002

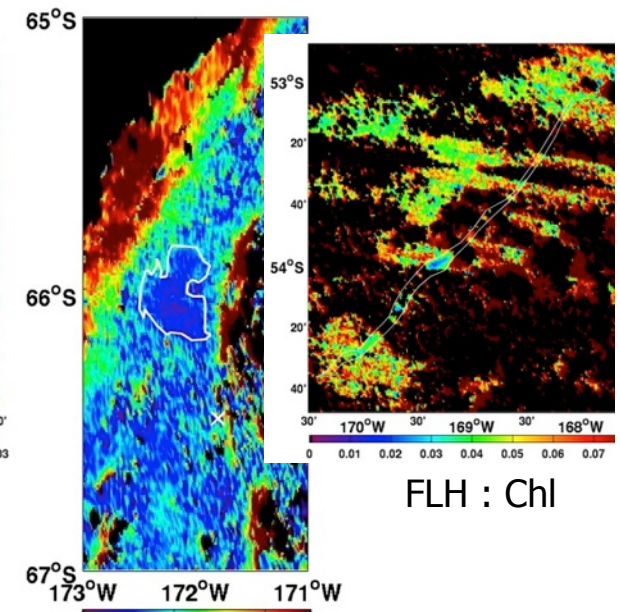
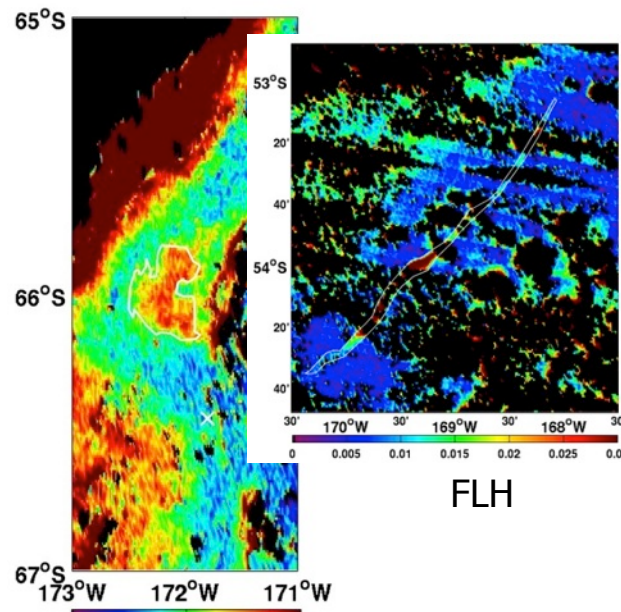
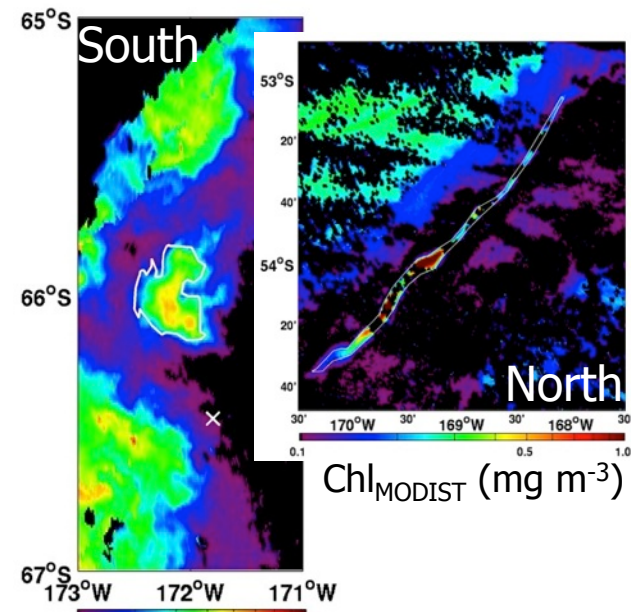


- Coverage is an issue (very cloudy!)
- MODIST consistent with SeaWiFS
- Chl increases, FLH increases, but FLH:Chl decreases!

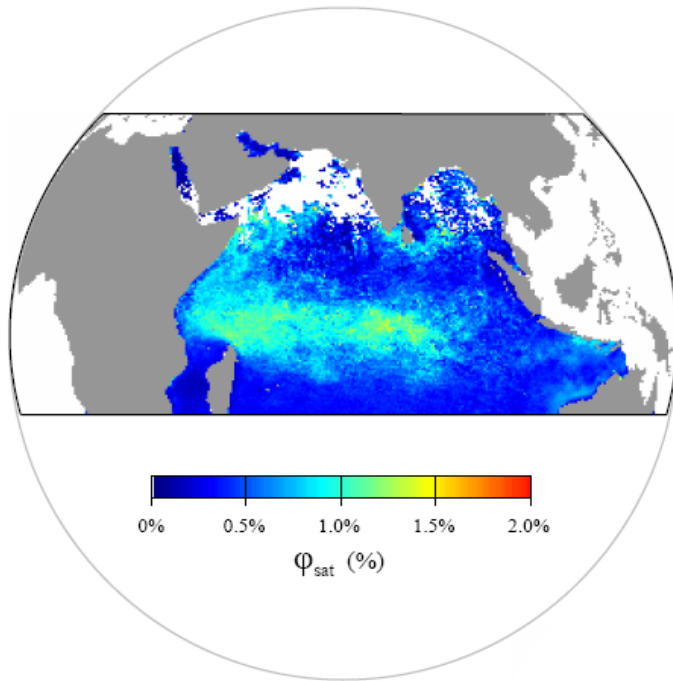
Fluorescence and Fe enrichment experiments -SOFeX



- North = SeaWiFS and MODIST from 12-13 Feb 2002
South = SeaWiFS and MODIST from 5 Feb 2002
- MODIST consistent with SeaWiFS
- Chl increases, FLH increases, but FLH:Chl decreases!



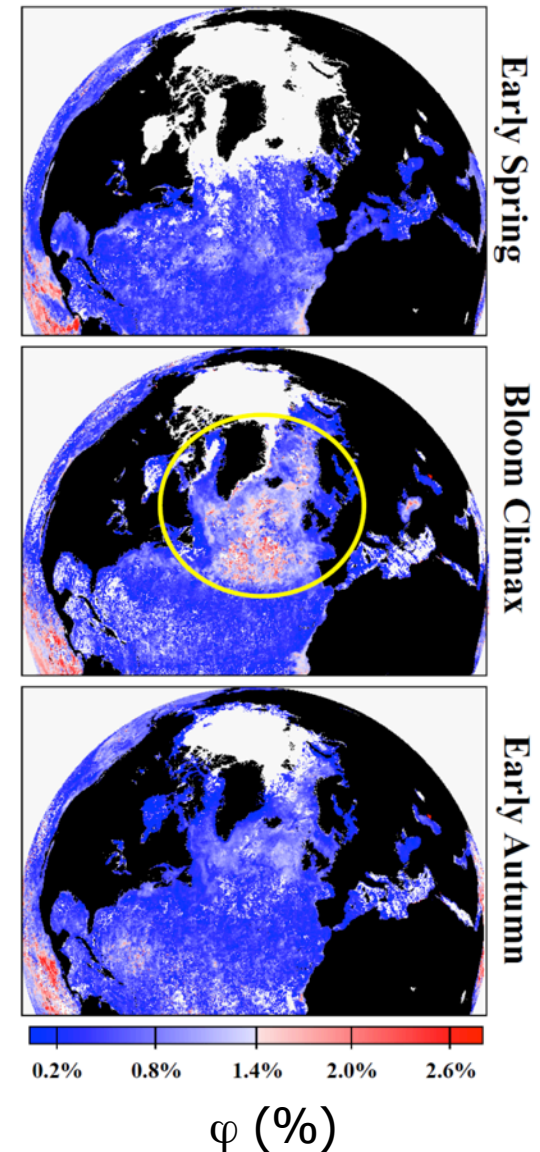
Indian Ocean Fluorescence Quantum Yields (ϕ)



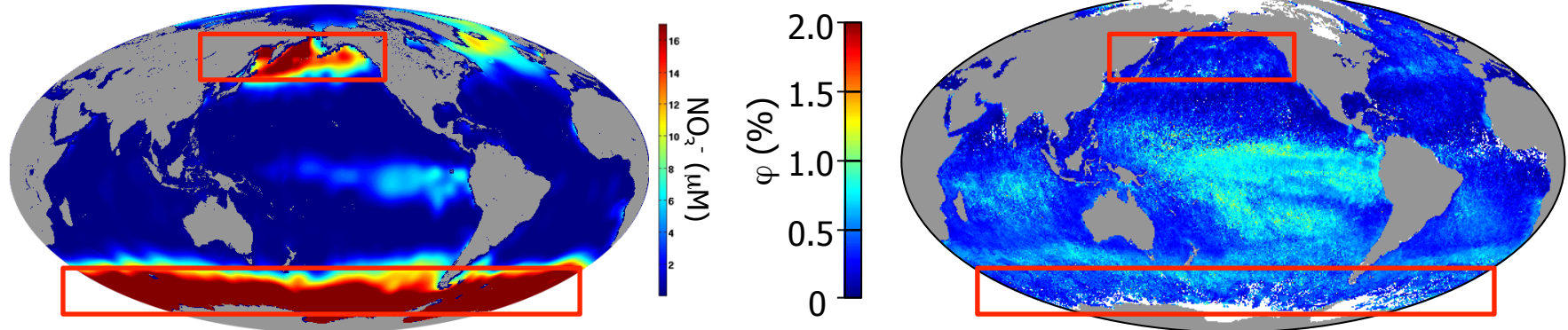
- Seasonally elevated fluorescence over south-central Indian Ocean
- Regionally tuned ecosystem model indicates Fe stress

North Atlantic Ocean φ

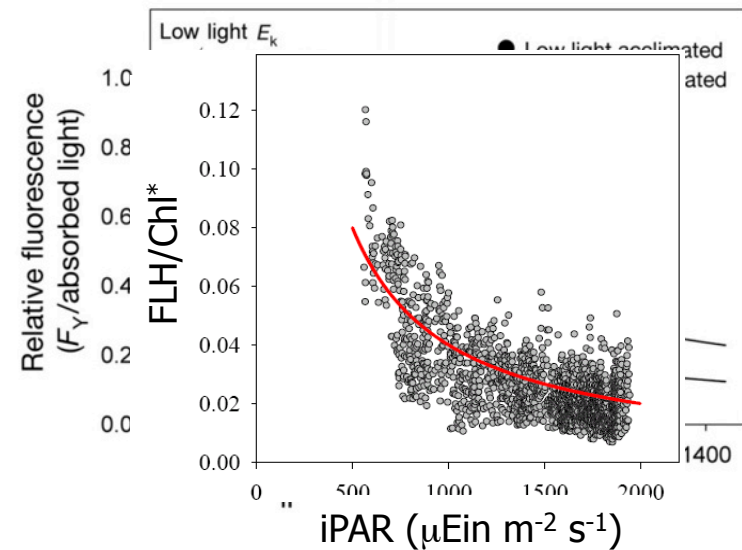
- Not generally thought of as being Fe-limited
- In some years, NO_3^- doesn't get drawn down all the way
- Recent field studies have demonstrated Fe-limitation of post-bloom phytoplankton communities (Nielsdotter et al., 2009; Ryan-Keough et al., 2013)



Photoacclimation, NPQ, and ϕ



- What about Fe-limited areas that do not show elevated fluorescence?
- Related to photoacclimation-dependent NPQ response



Conclusions

- Three major factors influence FLH and φ :
[Chl] > NPQ > packaging
- Remaining variability can be related to iron nutrition and photoacclimation
- Demonstrated response to active iron enrichment
- We understand how photoacclimation affects φ in the lab and field, but how do we incorporate that information into satellite studies?

Parting Thoughts

- Tool to map new areas of iron stress
Examine physiological changes over time
- Inclusion of FLH data into primary production modeling.
CAFÉ model
- Fluorescence capabilities for future missions?

Thank you!

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